

We claim:

- 1 1. A method for detecting one or more objects belonging to the same
2 object class comprising the steps of:
3 a). receiving a video sequence comprised of a plurality of image frames;
4 b). applying one or more classifiers to detect components of objects in an
5 image frame in the video sequence;
6 c). computing a confidence score based in part on the response from the
7 one or more component detectors;
8 d). repeating steps b). and c). to detect components of objects belonging
9 to the same object class in additional images frames in the video sequence; and
10 e). accumulating confidence scores from the component detectors to
11 determine if an object is detected.
- 1 2. The method of claim 1 wherein if accumulated confidence scores
2 indicate high confidence of a presence of an object, the method further
3 comprising the step of:
4 identifying the detected components to be an object of a particular type.
- 1 3. The method of claim 1 wherein the object class is a vehicle.
- 1 4. The method of claim 1 further comprising the step of:
2 if an object is detected, outputting a detection signal and object position.
- 1 5. The method of claim 2 further comprising the steps of:
2 testing geometry constraints on a spatial arrangement of detected
3 components in an image; and
4 applying whole-appearance classifiers an image patch that contains the
5 detected components and which is aligned according to the position of the
6 detected components.

1 6. The method of claim 5 wherein the geometry constraints are
2 derived from camera parameters.

1 7. The method of claim 5 wherein the geometry constraints are
2 derived from object size.

1 8. The method of claim 5 wherein the geometry constraints are
2 derived from a location of an object appearance in the image.

1 9. The method of claim 5 wherein the whole appearance classifiers
2 detect entire or partial object appearance, the entire or partial object appearance
3 being aligned according to positioning of at least two components.

1 10. The method of claim 1 wherein the component classifiers include
2 classifiers for detecting components at multiple scales.

1 11. The method of claim 1 wherein component classifiers are defined
2 by discriminant features and decision rules which are learned through boosted
3 training.

1 12. The method of claim 11 wherein the discriminant features include
2 corners.

1 13. The method of claim 11 wherein the discriminant features include
2 horizontal edges.

1 14. The method of claim 11 wherein the discriminant features include
2 vertical edges.

1 15. The method of claim 11 wherein the discriminant features include
2 horizontal stripes.

1 16. The method of claim 11 wherein the discriminant features include
2 vertical stripes.

1 17. The method of claim 11 wherein the discriminant features include
2 diagonal stripes.

1 18. The method of claim 11 further comprising the step of:
2 performing an online adaptation to adapt a classifier structure to an online
3 pattern.

1 19. The method of claim 18 wherein the step of performing an online
2 adaptation further comprises the step of:
3 applying a dynamic switching strategy to direct the detector to take
4 appropriate weak classifiers as discriminants according to auxiliary information
5 about the online pattern.

1 20. The method of claim 2 wherein the one or more classifiers include
2 overlapping component classifiers.

1 21. The method of claim 20 wherein the overlapping component
2 classifiers comprises four corners representing a rear profile of a vehicle.

1 22. The method of claim 20 wherein the overlapping component
2 classifiers comprises four corners representing a frontal profile of a vehicle.

1 23. The method of claim 20 wherein the overlapping component
2 classifiers comprises four corners representing a side profile of a vehicle.

1 24. The method of claim 21 wherein one of the overlapping component
2 classifiers detects the bottom left corner of a vehicle.

1 25. The method of claim 21 wherein one of the overlapping component
2 classifiers detects the bottom right corner of a vehicle.

1 26. The method of claim 21 wherein one of the overlapping component
2 classifiers detects the top left corner of a vehicle.

1 27. The method of claim 21 wherein one of the overlapping component
2 classifiers detects the top right corner of a vehicle.

1 28. The method of claim 21 wherein positioning of the four corners of
2 the rear profile for a vehicle differ for different classes of vehicles.

1 29. The method of claim 28 wherein a class of vehicle includes
2 sedans.

1 30. The method of claim 28 wherein a class of vehicle includes sports
2 utility vehicles.

1 31. The method of claim 28 wherein a class of vehicle includes vans.

1 32. The method of claim 28 wherein a class of vehicle includes tractor
2 trailers.

1 33. The method of claim 28 wherein a class of vehicle includes trucks.

1 34. The method of claim 21 wherein a distance between any two
2 corners of the vehicle is constrained.

1 35. The method of claim 34 wherein the constraint between any two
2 corners of the vehicle is scaled based on a distance between the vehicle and a
3 camera capturing the video sequence and camera parameters.

1 36. The method of claim 35 wherein an image pyramid of multiple
2 resolutions is used to detect objects of size $2 \times x$, $4 \times x$ and so on with the classifier
3 for the size x .

1 37. The method of claim 1 wherein the accumulated confidence scores
2 are inferred from confidence scores across multiple frames using a recursive
3 filter.

1 38. The method of claim 37 wherein when the accumulated
2 confidence score is a linear combination of the confidence scores of multiple
3 component classifiers and the whole-appearance classifiers.

1 39. The method of claim 38 wherein when the confidence score for a
2 principal component classifier is sufficiently high, the confidence score of the
3 remaining component classifiers and the whole-appearance classifier are
4 computed.

1 40. The method of claim 2 wherein if an object is detected the method
2 comprising the step of:
3 tracking the object over subsequent image frames.

1 41. The method of claim 40 wherein the step of tracking the object
2 further comprises the step of:
3 restricting an area of search in each subsequent image frame based on
4 the location of the object in a current image frame.

1 42. The method of claim 40 wherein the step of tracking the object
2 further comprises the step of:
3 determining the optimal classifier scale based on a distance between the
4 object and a camera detecting the object and camera parameters.

1 43. The method of claim 1 wherein the confidence scores of
2 component classifiers are computed in a coarse to fine framework.

1 44. The method of claim 1 wherein detection is performed on an
2 image pyramid of multiple resolutions.

1 45. The method of claim 1 wherein an object class includes
2 pedestrians.

1 46. The method of claim 1 wherein an object class includes bicycles.

1 47. The method of claim 1 wherein an object class includes
2 motorcycles.

1 48. The method of claim 1 wherein object class includes different types
2 of traffic signs.

1 49. A system for detection and tracking an object comprising:
2 a camera for capturing a video sequence comprised of a plurality of image
3 frames;
4 a processor for receiving the video sequence and analyzing each image
5 frame to determine if an object is detected, said processor applying one or more
6 classifiers to detect components of objects in each image frame and computing a
7 confidence score based on the response from the one or more component
8 detectors and the result of additional validation; and
9 a database for storing the one or more classifiers and object training
10 samples

- 1 50. The method of claim 49 wherein the object class is a vehicle.
- 1 51. The method of claim 49 wherein the object class is a pedestrian.
- 1 52. The method of claim 49 wherein the object class is a bicycle.
- 1 53. The method of claim 49 wherein the object class is a motorbike.
- 1 54. The method of claim 49 wherein the object class includes different
2 types of traffic signs.
- 1 55. The system of claim 49 wherein the detected components are
2 determined to be an object if the confidence scores are high.
- 1 56. The system of claim 55 wherein if an object is detected, the
2 processor outputs a warning signal.
- 1 57. The system of claim 49 further comprising :
2 a display for displaying the video sequence.
- 1 58. The system of claim 49 wherein the processor further comprises:
2 means for testing geometry constraints on a spatial arrangement of
3 detected components in an image; and
4 means for applying whole-appearance classifiers an image patch that
5 contains the detected components and which is aligned according to the position
6 of the detected components.
- 1 59. The system of claim 58 wherein the geometry constraints are
2 derived from camera parameters.

1 60. The system of claim 58 wherein the geometry constraints are
2 derived from object size.

1 61. The system of claim 58 wherein the geometry constraints are
2 derived from a location of an object appearance in the image.

1 62. The system of claim 58 wherein the whole appearance classifiers
2 detect entire or partial object appearance, the entire or partial object appearance
3 being aligned according to positioning of at least two components.

1 63. The system of claim 49 wherein the component classifiers include
2 classifiers for detecting components at multiple scales.

1 64. The system of claim 49 wherein component classifiers are defined
2 by discriminant features and decision rules which are learned through boosted
3 training.

1 65. The system of claim 64 wherein the discriminant features include
2 corners.

1 66. The system of claim 64 wherein the discriminant features include
2 horizontal edges.

1 67. The system of claim 64 wherein the discriminant features include
2 vertical edges.

1 68. The system of claim 64 wherein the discriminant features include
2 horizontal stripes.

1 69. The system of claim 64 wherein the discriminant features include
2 vertical stripes.

1 70. The system of claim 64 wherein the discriminant features include
2 diagonal stripes.

1 71. The system of claim 64 further comprising the step of:
2 performing an online adaptation to adapt a classifier structure to an online
3 pattern.

1 72. The system of claim 71 wherein the step of performing an online
2 adaptation further comprises the step of:
3 applying a dynamic switching strategy to direct the detector to take
4 appropriate weak classifiers as discriminants according to auxiliary information
5 about the online pattern.

1 73. The system of claim 49 wherein the one or more classifiers include
2 overlapping component classifiers.

1 74. The system of claim 73 wherein the overlapping component
2 classifiers comprises four corners representing a rear profile of a vehicle.

1 75. The system of claim 74 wherein one of the overlapping component
2 classifiers detects the bottom left corner of a vehicle.

1 76. The system of claim 74 wherein one of the overlapping component
2 classifiers detects the bottom right corner of a vehicle.

1 77. The system of claim 74 wherein one of the overlapping component
2 classifiers detects the top left corner of a vehicle.

1 78. The system of claim 74 wherein one of the overlapping component
2 classifiers detects the top right corner of a vehicle.

1 79. The system of claim 74 wherein positioning of the four corners of
2 the rear profile for a vehicle differ for different classes of vehicles.

1 80. The system of claim 79 wherein a class of vehicle includes sedans.

1 81. The system of claim 79 wherein a class of vehicle includes sports
2 utility vehicles.

1 82. The system of claim 79 wherein a class of vehicle includes vans.

1 83. The system of claim 79 wherein a class of vehicle includes tractor
2 trailers.

1 84. The system of claim 74 wherein a distance between any two
2 corners of the vehicle is constrained.

1 85. The system of claim 84 wherein the constraint between any two
2 corners of the vehicle is scaled based on a distance between the vehicle and a
3 camera capturing the video sequence as well as camera parameters.

1 86. The system of claim 85 wherein an image pyramid of multiple
2 resolutions is used to detect objects of size $2 \times x$, $4 \times x$ and so on with the classifier
3 for the size x .

1 87. The system of claim 49 wherein the accumulated confidence
2 scores is inferred from confidence scores across multiple frames using a
3 recursive filter.

1 88. The system of claim 87 wherein when the accumulated confidence
2 score is a linear combination of the confidence scores of multiple component
3 classifiers and the whole-appearance classifiers.

1 89. The system of claim 87 wherein when the confidence score for a
2 principal component classifier is sufficiently high, the confidence score of the
3 remaining component classifiers and the whole-appearance classifier are
4 computed.

1 90. The system of claim 49 wherein the processor comprises:
2 means for tracking a detected object over subsequent image frames.

1 91. The system of claim 90 wherein tracking means further comprises:
2 means for restricting an area of search in each subsequent image frame
3 based on the location of the object in a current image frame.

1 92. The system of claim 90 wherein the tracking means further
2 comprises:
3 means for determining the optimal classifier scale based on a distance
4 between the object and a camera.detecting the object and camera parameters.

 93. The system of claim 49 wherein the confidence scores of
component classifiers are computed in a coarse to fine framework

1 94. The system of claim 49 wherein detection and tracking is
2 performed on an image pyramid of multiple resolutions.

1 95. A method for tracking one or more objects depicted in a video
2 sequence comprising:
3 receiving a video sequence comprised of a plurality of image frames;
4 detecting an object to be tracked in one of the image frames;
5 computing one or more appearance trajectories based on the position of
6 the tracked object to estimate the direction in which the tracked object is
7 traveling; and

8 determining if the object is the tracked object based on the appearance
9 trajectory.

1 96. The method of claim 95 wherein said step of determining if the
2 object is the tracked object further comprises the steps of:
3 applying one or more classifiers to the computed appearance trajectory;
4 computing a confidence score for the computed appearance trajectory;
5 and
6 determining the object to be the tracked object if the confidence score is
7 high.

1 97. The method of claim 95 wherein the computation of the
2 appearance trajectory considers physically well-founded motion constraints.

1 98. The method of claim 95 wherein the trajectories are computed by
2 accumulating detection results over multiple frames.

1 99. The method of claim 98 wherein the computed appearance
2 trajectory determines changes in position, scale, location and aspect conditions
3 in consecutive frames.

1 100. The method of claim 95 wherein the tracked object is a vehicle.

1 101. The method of claim 95 wherein the tracked object is a pedestrian.

1 102. The method of claim 95 wherein the tracked object is a bicycle.

1 103. The method of claim 95 wherein the tracked object is a motorbike.

1 104. The method of claim 95 wherein the tracked object includes
2 different types of traffic signs.